Chiem Exercise 8

MAT 115 Exercise #8

In this exercise we are going to continue exploring the tidyverse (sections 4.5 to 4.14 of the text). We will mostly be focusing on the programming concept called piping.

This will be a two-class day exercise. Stop around line 150 on the first day and finish the rest on the second day.

As usual, we first load dslabs and tidyverse. We will use a new dataset for this exercise. It is the starwars dataset from the dplyr package (this seems appropriate, no?). Note, tidyverse is actually a set of packages and dplyr is part of that set, so you do not need to load it separately.

```
library(tidyverse)
library(dslabs)
```

4.5 How do we calculate the value of $\sin(\sqrt{e^x})$ when x = 1.38629? Well, we execute the following steps:

$$1.38629 \rightarrow e^{1.38629} = 4 \rightarrow \sqrt{4} = 2 \rightarrow \sin(2) = 0.91$$

The function notation $\sin(\sqrt{e^x})$ is in a sense backwards. When we plug in x=1.38629, the first thing we do is take the exponential, not the sine. The sequence of calculation steps is more in keeping with how we humans think. The R pipe %>% is an attempt to implement this step-by-step way of thinking. When we write something like LHS %>% RHS, it means that the function on the RHS takes the LHS as its first argument. So 2 %>% exp means the same thing as exp(2), and 8 %>% log(2) means the same thing as log(8,2).

```
# Try out those commands.
2 %>% exp
```

[1] 7.389056

```
#exp(2)

8 %>% log(2)
```

[1] 3

```
#log(8, 2)
```

Recall that we can use the mutate function to constructed new dataframes. Here is an example:

```
newwars <- mutate(starwars,avHW=(height+mass)/2)
#newwars</pre>
```

This can also be written as

```
newwars <- starwars %>% mutate(avHW=(height+mass)/2)
head(newwars)
```

```
## # A tibble: 6 x 15
               height mass hair_color skin_color eye_color birth_year sex
     name
                                                                                gender
##
                <int> <dbl> <chr>
     <chr>>
                                        <chr>>
                                                    <chr>
                                                                    <dbl> <chr> <chr>
## 1 Luke Skv~
                          77 blond
                  172
                                        fair
                                                    blue
                                                                    19
                                                                          male
                                                                                mascu~
## 2 C-3PO
                  167
                          75 <NA>
                                        gold
                                                                   112
                                                    yellow
                                                                          none
                                                                                mascu~
## 3 R2-D2
                   96
                          32 <NA>
                                        white, bl~ red
                                                                     33
                                                                          none
                                                                                mascu~
                  202
## 4 Darth Va~
                         136 none
                                        white
                                                    yellow
                                                                     41.9 male
                                                                                mascu~
## 5 Leia Org~
                  150
                         49 brown
                                        light
                                                    brown
                                                                     19
                                                                          fema~ femin~
## 6 Owen Lars
                  178
                         120 brown, gr~ light
                                                    blue
                                                                     52
                                                                          male mascu~
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
```

Which of these two versions do you find more intuitive? Why?

(Note: with R version 4.1.0 and above, the pipe operator |> was included in base R. The %>% operator is older and part of the tidyverse. %>% and |> work in very similar ways.)

4.9 If you want to reorder the rows of a dataframe, you can use the arrange function. For example, if you want to sort the star wars characters based on average height and weight, you can do this:

```
newwars %>% arrange(avHW)
```

```
## # A tibble: 87 x 15
##
      name
               height mass hair_color skin_color eye_color birth_year sex
                                                                                gender
                <int> <dbl> <chr>
                                                                   <dbl> <chr> <chr>
##
      <chr>
                                        <chr>
                                                    <chr>
##
   1 Yoda
                   66
                          17 white
                                                    brown
                                                                     896 male
                                        green
                                                                                mascu~
   2 Ratts T~
                   79
                          15 none
                                        grey, blue unknown
                                                                      NA male
                                                                                mascu~
##
    3 Wicket ~
                   88
                          20 brown
                                        brown
                                                    brown
                                                                        8 male
                                                                                mascu~
##
    4 R2-D2
                   96
                          32 <NA>
                                        white, bl~ red
                                                                      33 none
                                                                                mascu~
##
   5 R5-D4
                   97
                          32 <NA>
                                        white, red red
                                                                      NA none
                                                                                mascu~
##
   6 Dud Bolt
                   94
                          45 none
                                                                      NA male
                                        blue, grey yellow
                                                                                mascu~
    7 Sebulba
##
                  112
                          40 none
                                        grey, red
                                                    orange
                                                                      NA male
                                                                                mascu~
                                                                      19 fema~ femin~
##
    8 Leia Or~
                  150
                          49 brown
                                        light
                                                    brown
##
   9 Barriss~
                  166
                          50 black
                                        yellow
                                                    blue
                                                                      40 fema~ femin~
## 10 Zam Wes~
                  168
                          55 blonde
                                        fair, gre~ yellow
                                                                      NA fema~ femin~
## # i 77 more rows
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
```

The sorting is done lowest to highest by default. Explore the help documentation of arrange and try to figure out how to sort highest to lowest.

```
# Write your code here.
newwars %>% arrange(desc(avHW));
## # A tibble: 87 x 15
##
      name
               height mass hair_color skin_color eye_color birth_year sex
##
                <int> <dbl> <chr>
      <chr>
                                        <chr>>
                                                    <chr>
                                                                    <dbl> <chr> <chr>
                  175 1358 <NA>
##
    1 Jabba D~
                                        green-tan~ orange
                                                                    600
                                                                          herm~ mascu~
##
    2 Grievous
                  216
                         159 none
                                        brown, wh~ green, y~
                                                                     NA
                                                                          male
                                                                                mascu~
##
  3 Tarfful
                  234
                         136 brown
                                        brown
                                                    blue
                                                                     NA
                                                                          male
                                                                                mascu~
##
  4 Chewbac~
                  228
                         112 brown
                                        unknown
                                                    blue
                                                                    200
                                                                          male
                                                                                mascu~
## 5 IG-88
                  200
                         140 none
                                        metal
                                                    red
                                                                     15
                                                                          none
                                                                                mascu~
                         136 none
##
  6 Darth V~
                  202
                                                    yellow
                                                                     41.9 male
                                        white
                                                                                mascu~
  7 Lama Su
                  229
                                                                          male
##
                          88 none
                                        grey
                                                    black
                                                                     NA
                                                                                mascu~
   8 Roos Ta~
                  224
                          82 none
                                                    orange
                                                                     NA
                                                                          male
                                                                                mascu~
                                        grey
## 9 Bossk
                   190
                         113 none
                                                    red
                                                                     53
                                                                          male
                                        green
                                                                                mascu~
## 10 Dexter ~
                  198
                         102 none
                                                                     NA
                                                                          male
                                        brown
                                                    yellow
                                                                                mascu~
## # i 77 more rows
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
Reproduce this outcome with base R functionality.
# Write your code here.
newwars[order((newwars$height+newwars$mass)/2, decreasing = TRUE),]
## # A tibble: 87 x 15
##
      name
               height mass hair color skin color eye color birth year sex
                                                                    <dbl> <chr> <chr>
##
                <int> <dbl> <chr>
      <chr>>
                                        <chr>
                                                    <chr>
##
    1 Jabba D~
                  175 1358 <NA>
                                        green-tan~ orange
                                                                    600
                                                                          herm~ mascu~
##
    2 Grievous
                  216
                         159 none
                                        brown, wh~ green, y~
                                                                     NA
                                                                          male
                                                                                mascu~
##
  3 Tarfful
                  234
                         136 brown
                                        brown
                                                                     NA
                                                    blue
                                                                          male
                                                                                mascu~
  4 Chewbac~
##
                  228
                         112 brown
                                                                    200
                                        unknown
                                                    blue
                                                                          male
                                                                                mascu~
## 5 IG-88
                  200
                         140 none
                                                                     15
                                        metal
                                                    red
                                                                          none
                                                                                mascu~
   6 Darth V~
                  202
##
                         136 none
                                        white
                                                    yellow
                                                                     41.9 male
                                                                                mascu~
   7 Lama Su
                  229
                          88 none
                                        grey
                                                    black
                                                                     NA
                                                                          male
                                                                                mascu~
##
  8 Roos Ta~
                  224
                          82 none
                                                                     NA
                                                                          male
                                        grey
                                                    orange
                                                                                mascu~
    9 Bossk
                   190
                         113 none
                                                    red
                                                                     53
                                                                          male
                                                                                mascu~
                                        green
## 10 Dexter ~
                  198
                         102 none
                                        brown
                                                    yellow
                                                                     NA
                                                                          male
                                                                                mascu~
## # i 77 more rows
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
It is also possible to sort using two columns.
newwars %>% arrange(height, mass) %>% head(20)
## # A tibble: 20 x 15
##
               height mass hair_color skin_color eye_color birth_year sex
##
                <int> <dbl> <chr>
                                                    <chr>
      <chr>
                                        <chr>>
                                                                    <dbl> <chr> <chr>
##
    1 Yoda
                   66
                          17 white
                                        green
                                                    brown
                                                                      896 male
                                                                                mascu~
```

grey, blue unknown

NA male mascu~

2 Ratts T~

79

15 none

```
3 Wicket ~
                    88
                          20 brown
                                          brown
                                                     brown
                                                                          8 male
                                                                                  mascu~
##
    4 Dud Bolt
                    94
                          45 none
                                         blue, grey yellow
                                                                         NA male
                                                                                  mascu~
##
    5 R2-D2
                    96
                          32 <NA>
                                         white, bl~ red
                                                                         33 none
                                                                                  mascu~
                                         silver, r~ red, blue
##
    6 R4-P17
                    96
                          NA none
                                                                        NA none
                                                                                  femin~
##
    7 R5-D4
                    97
                          32 <NA>
                                         white, red red
                                                                        NA none
                                                                                  mascu~
    8 Sebulba
##
                   112
                          40 none
                                         grey, red orange
                                                                        NA male
                                                                                  mascu~
##
    9 Gasgano
                   122
                          NA none
                                         white, bl~ black
                                                                        NA male
                                                                                  mascu~
## 10 Watto
                   137
                          NA black
                                         blue, grey yellow
                                                                        NA male
                                                                                  mascu~
## 11 Leia Or~
                   150
                          49 brown
                                         light
                                                     brown
                                                                         19 fema~ femin~
## 12 Mon Mot~
                   150
                          NA auburn
                                         fair
                                                     blue
                                                                         48 fema~ femin~
## 13 Cordé
                   157
                          NA brown
                                         light
                                                     brown
                                                                        NA
                                                                            <NA>
                                                                                  <NA>
## 14 Nien Nu~
                   160
                          68 none
                                         grey
                                                     black
                                                                         NA male
                                                                                  mascu~
## 15 Ben Qua~
                   163
                          65 none
                                         grey, gre~
                                                                        NA male
                                                                                  mascu~
                                                     orange
## 16 Shmi Sk~
                   163
                          NA black
                                         fair
                                                     brown
                                                                         72 fema~ femin~
## 17 Beru Wh~
                   165
                                                                         47 fema~ femin~
                          75 brown
                                         light
                                                     blue
## 18 Dormé
                   165
                          NA brown
                                         light
                                                     brown
                                                                         NA fema~ femin~
## 19 Barriss~
                   166
                          50 black
                                         yellow
                                                     blue
                                                                         40 fema~ femin~
## 20 C-3PO
                   167
                          75 <NA>
                                                                        112 none
                                                                                  mascu~
                                         gold
                                                     vellow
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
```

Inspect this output and explain in your own words how arrange sorts by two columns. How does it handle NA values?

A: Irregardless of mass, it seems to sort by height in ascending order, ignoring the NA mass values. It sorts based on the first column. If you switch mass and height, it sorts by mass in ascending order. If you get rid of second arg, it doesn't change the order.

Confirm your understanding by sorting using mass first then height.

```
# Write your code here.
newwars %>% arrange(mass, height) %>% head(20)
```

```
##
   # A tibble: 20 x 15
##
                height
                        mass hair_color skin_color eye_color birth_year sex
                                                                                   gender
      name
##
      <chr>
                 <int> <dbl> <chr>
                                          <chr>
                                                      <chr>
                                                                      <dbl> <chr> <chr>
##
    1 Ratts T~
                    79
                        15
                              none
                                          grey, blue unknown
                                                                         NA male
                                                                                   mascu~
    2 Yoda
                        17
##
                    66
                              white
                                          green
                                                      brown
                                                                        896 male
                                                                                   mascu~
##
                    88
                        20
    3 Wicket ~
                                          brown
                                                      brown
                                                                          8 male
                              brown
                                                                                   mascu~
    4 R2-D2
##
                    96
                        32
                              <NA>
                                          white, bl~ red
                                                                         33 none
                                                                                   mascu~
##
    5 R5-D4
                    97
                        32
                              <NA>
                                          white, red red
                                                                         NA none
                                                                                   mascu~
##
    6 Sebulba
                   112
                        40
                              none
                                          grey, red
                                                      orange
                                                                         NA male
                                                                                   mascu~
##
    7 Dud Bolt
                    94
                        45
                              none
                                          blue, grey yellow
                                                                         NA male
                                                                                   mascu~
##
    8 Padmé A~
                   185
                        45
                                          light
                                                                         46 fema~ femin~
                              brown
                                                      brown
##
    9 Sly Moo~
                   178
                        48
                              none
                                          pale
                                                      white
                                                                         NA <NA>
                                                                                   <NA>
## 10 Wat Tam~
                   193
                        48
                                          green, gr~ unknown
                                                                         NA male
                                                                                   mascu~
                              none
## 11 Leia Or~
                   150
                        49
                              brown
                                          light
                                                      brown
                                                                         19 fema~ femin~
## 12 Barriss~
                   166
                        50
                              black
                                          yellow
                                                      blue
                                                                         40 fema~ femin~
## 13 Adi Gal~
                   184
                        50
                              none
                                                      blue
                                                                         NA fema~ femin~
                                          dark
                        55
## 14 Zam Wes~
                   168
                              blonde
                                                                         NA fema~ femin~
                                          fair, gre~
                                                      yellow
## 15 Ayla Se~
                   178
                        55
                              none
                                          blue
                                                      hazel
                                                                         48 fema~ femin~
## 16 Luminar~
                   170
                                                                         58 fema~ femin~
                        56.2 black
                                          yellow
                                                      blue
## 17 Shaak Ti
                   178
                        57
                                                                         NA fema~ femin~
                              none
                                          red, blue~ black
```

```
grey, gre~ orange
## 18 Ben Qua~
                  163
                       65
                                                                       NA male
                             none
                                                                                mascu~
## 19 Jar Jar~
                   196
                       66
                                                                       52 male
                             none
                                        orange
                                                    orange
                                                                                mascu~
                                                    black
## 20 Nien Nu~
                  160
                       68
                             none
                                        grey
                                                                       NA male
                                                                                mascu~
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
```

There is also a top_n function that is useful when we want to take a quick look at the top n values of the data without fully rearranging the rows.

```
## # A tibble: 5 x 15
##
     name
               height mass hair_color skin_color eye_color birth_year sex
                                                                                 gender
                                                    <chr>
##
     <chr>
                <int> <dbl> <chr>
                                         <chr>
                                                                    <dbl> <chr> <chr>
## 1 Chewbacca
                   228
                         112 brown
                                         unknown
                                                    blue
                                                                      200 male
                                                                                 mascu~
## 2 Jabba De~
                   175
                        1358 <NA>
                                         green-tan~ orange
                                                                      600 herm~ mascu~
## 3 IG-88
                   200
                         140 none
                                         metal
                                                    red
                                                                       15 none
                                                                                 mascu~
## 4 Grievous
                   216
                         159 none
                                         brown, wh~ green, y~
                                                                       NA male
                                                                                 mascu~
## 5 Tarfful
                   234
                         136 brown
                                         brown
                                                    blue
                                                                       NA male
                                                                                 mascu~
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
```

What do you think occurs if we use a negative number for n? Try it out.

newwars %>% top_n(5,avHW)

Use your new skills to determine the 10 oldest characters in the starwars dataset.

```
# Write your code here.
newwars %>% top_n(10, birth_year)
```

```
## # A tibble: 10 x 15
##
      name
               height mass hair_color skin_color eye_color birth_year sex
                                                                                  gender
##
      <chr>
                 <int> <dbl> <chr>
                                         <chr>
                                                     <chr>
                                                                     <dbl> <chr> <chr>
##
   1 C-3PO
                   167
                          75 <NA>
                                         gold
                                                     yellow
                                                                       112 none
                                                                                 mascu~
##
    2 Chewbac~
                   228
                         112 brown
                                         unknown
                                                     blue
                                                                       200 male
                                                                                 mascu~
##
    3 Jabba D~
                   175
                        1358 <NA>
                                         green-tan~ orange
                                                                       600 herm~ mascu~
##
    4 Yoda
                    66
                          17 white
                                         green
                                                     brown
                                                                       896 male
                                                                                 mascu~
##
    5 Palpati~
                   170
                          75 grey
                                                     yellow
                                                                        82 male
                                         pale
                                                                                 mascu~
    6 Qui-Gon~
##
                   193
                          89 brown
                                         fair
                                                     blue
                                                                        92 male
                                                                                  mascu~
##
   7 Finis V~
                   170
                          NA blond
                                         fair
                                                     blue
                                                                        91 male
                                                                                  mascu~
##
    8 Ki-Adi-~
                   198
                          82 white
                                         pale
                                                     yellow
                                                                        92 male
                                                                                  mascu~
                   183
   9 Cliegg ~
                          NA brown
                                         fair
                                                     blue
                                                                        82 male
                                                                                 mascu~
## 10 Dooku
                   193
                          80 white
                                                                       102 male
                                         fair
                                                     brown
## # i 6 more variables: homeworld <chr>, species <chr>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>
```

4.7 The summarize function is probably the most complicated of the dplyr functions we look at here. Its purpose is to calculate summaries (such as mean, median, standard deviation, etc) of the variables in a dataframe. By itself it doesn't do much; other functions do the actual work.

```
newwars %>% summarize(avgH=mean(height,na.rm=T),std1=sd(height,na.rm=T))
```

```
## # A tibble: 1 x 2
## avgH std1
## <dbl> <dbl>
## 1 175. 34.8
```

(Note that we include the na.rm argument to strip NAs before the calculations.)

The output is a dataframe; in this case, the output has one row and two columns.

Describe in words what you output tells us.

How could you do this using base R functionality?

```
# Write your code here.
data.frame(avgH = mean(newwars$height, na.rm=T), std1 = sd(newwars$height, na.rm=T))
## avgH std1
## 1 174.6049 34.77416
```

There is a version of summarize called summarize_all that could save some time. It calculates summaries (mean, or median, or standard deviation, or others) of *all* the variables in a dataframe. If a summary is not appropriate, it returns NA.

```
newwars %>% summarize_all(mean, na.rm=T)

## Warning: There were 11 warnings in 'summarise()'.

## The first warning was:

## i In argument: 'name = (function (x, ...) ...'.

## Caused by warning in 'mean.default()':

## ! argument is not numeric or logical: returning NA

## i Run 'dplyr::last_dplyr_warnings()' to see the 10 remaining warnings.

## # A tibble: 1 x 15

## name height mass hair_color skin_color eye_color birth_year sex gender
```

<dbl>

NA

<dbl>

NA

<dbl> <dbl>

NA

87.6

<dbl>

NA

You can use summarize_if in order to avoid getting NAs.

<dbl>

vehicles <dbl>, starships <dbl>, avHW <dbl>

NA

i 6 more variables: homeworld <dbl>, species <dbl>, films <dbl>,

```
newwars %>% summarize_if(is.numeric, mean, na.rm=T)
```

```
## # A tibble: 1 x 4
## height mass birth_year avHW
## <dbl> <dbl> <dbl> <dbl> ## 1 175. 97.3 87.6 136.
```

<dbl> <dbl> <dbl>

175. 97.3

NA

##

1

Use the summarize function to make a new dataframe that is composed of the mean and standard deviation of height and mass in the newwars dataset.

```
# Write code here.
newwars %>% summarize(avgH=mean(height,na.rm=T),std1=sd(height,na.rm=T), avgM = mean(mass, na.rm=T), st
## # A tibble: 1 x 4
## avgH std1 avgM std2
## <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> = ## 1 175. 34.8 97.3 169.
```

But the real usefulness of summarize is when you combine it with the function group_by. When applied to a dataframe, the group_by function produces an object called a *grouped dataframe*, which is pretty similar to an ordinary dataframe, except it is aware that the data is divided into several groups.

Groups are determined by categorical variables. Let's apply the group_by function to the newwars.

```
newwars$species <- as.factor(newwars$species)</pre>
groupedwars <- newwars %>% group_by(species)
head(groupedwars)
## # A tibble: 6 x 15
## # Groups:
               species [2]
##
     name
               height mass hair color skin color eye color birth year sex
                                                                               gender
##
     <chr>>
                <int> <dbl> <chr>
                                        <chr>
                                                   <chr>
                                                                   <dbl> <chr> <chr>
## 1 Luke Sky~
                  172
                         77 blond
                                        fair
                                                   blue
                                                                    19
                                                                         male
                                                                               mascu~
## 2 C-3PO
                  167
                         75 <NA>
                                        gold
                                                   yellow
                                                                   112
                                                                         none
                                                                               mascu~
                                        white, bl~ red
## 3 R2-D2
                   96
                         32 <NA>
                                                                    33
                                                                         none
                                                                               mascu~
## 4 Darth Va~
                  202
                        136 none
                                        white
                                                   yellow
                                                                    41.9 male
                                                                               mascu~
## 5 Leia Org~
                  150
                         49 brown
                                        light
                                                   brown
                                                                    19
                                                                         fema~ femin~
## 6 Owen Lars
                  178
                        120 brown, gr~ light
                                                                    52
                                                   blue
                                                                         male mascu~
```

Not much different from just the newwars dataframe. It just identifies the groups and changes how it acts with other functions. If we apply the summarize function to this new dataframe, using the height, we get the following:

i 6 more variables: homeworld <chr>, species <fct>, films <list>,

vehicles <list>, starships <list>, avHW <dbl>

```
summarize(groupedwars,avg=mean(height, na.rm=T))
```

```
## # A tibble: 38 x 2
##
      species
                  avg
      <fct>
                <dbl>
##
##
  1 Aleena
                  79
## 2 Besalisk
                 198
  3 Cerean
                 198
##
##
  4 Chagrian
                 196
## 5 Clawdite
                 168
##
   6 Droid
                 131.
## 7 Dug
                 112
  8 Ewok
                  88
## 9 Geonosian 183
## 10 Gungan
                 209.
## # i 28 more rows
```

We get the mean of the height of each group. Compare that with what we get if the dataframe is not grouped:

```
summarise(newwars, avg=mean(height, na.rm=T))

## # A tibble: 1 x 1

## avg
## <dbl>
## 1 175.
```

We get the mean height of all the characters in the dataset.

A final note: we can get the means of all the groups with one line of code if we use pipes.

```
newwars %>% group_by(species) %>% summarize(avg=mean(height,na.rm=T))
```

```
## # A tibble: 38 x 2
      species
##
                  avg
##
      <fct>
                <dbl>
   1 Aleena
                  79
##
##
  2 Besalisk
                 198
  3 Cerean
##
                 198
##
  4 Chagrian
                 196
  5 Clawdite
##
                 168
##
  6 Droid
                 131.
##
  7 Dug
                 112
##
   8 Ewok
                  88
## 9 Geonosian
                183
## 10 Gungan
                 209.
## # i 28 more rows
```

For the purposes of readability, I actually prefer to put each step of the process on different lines, as below:

```
newwars %>%
group_by(species) %>%
summarize(avg=mean(height,na.rm=T))
```

```
## # A tibble: 38 x 2
##
      species
                  avg
##
      <fct>
                <dbl>
   1 Aleena
##
                  79
##
  2 Besalisk
                 198
##
  3 Cerean
                 198
  4 Chagrian
##
                 196
## 5 Clawdite
                 168
##
  6 Droid
                 131.
## 7 Dug
                 112
## 8 Ewok
                  88
## 9 Geonosian
                183
## 10 Gungan
                 209.
## # i 28 more rows
```

Below is another example. Explain in your own words what it does in a step-by-step manner.

A: newwars is being accessed so then it can use the group_by() function to group the homeworld variable. This new dataframe is accessed by the summarize function in order to find the standard deviations of the heights. These are then assigned to newwars2 in order to create a dataframe with the homeworlds and the standard deviations

```
newwars2 <- newwars %>%
  group_by(homeworld) %>%
  summarize(sd=sd(height,na.rm=T))
newwars2
```

```
## # A tibble: 49 x 2
##
     homeworld
                       sd
##
     <chr>
                    <dbl>
##
  1 Alderaan
                    22.9
##
   2 Aleen Minor
                    NA
## 3 Bespin
                    NA
## 4 Bestine IV
                    NA
## 5 Cato Neimoidia NA
## 6 Cerea
## 7 Champala
                    NA
## 8 Chandrila
                    NA
## 9 Concord Dawn
                    NA
## 10 Corellia
                     7.07
## # i 39 more rows
```

Let's use the famous iris dataset to get a little more practice. It has measurements of lengths and widths of three kinds of irises: setosa, versicolor, and virginica.

Link: Iris wikipedia

Calculate the average Petal.Width by Species and put the values in DESCENDING order by the average. Do all of this in one series of pipes.

```
# Write your code here.
iris %>%
group_by(Species) %>%
summarize(AvgPW = mean(Petal.Width, na.rm=T)) %>%
arrange(desc(AvgPW))
```

```
## # A tibble: 3 x 2
## Species AvgPW
## <fct> <dbl>
## 1 virginica 2.03
## 2 versicolor 1.33
## 3 setosa 0.246
```

Here is another challenge. Can you do the SAME thing I asked you to do with the iris data but with base R functionality? Give it your best attempt.

```
# Write your code here.
species <- unique(iris$Species)
mean1 <- mean(iris$Petal.Width[iris$Species == species[1]])</pre>
```

```
mean2 <- mean(iris$Petal.Width[iris$Species == species[2]])
mean3 <- mean(iris$Petal.Width[iris$Species == species[3]])

AvgPW <- c(mean1, mean2, mean3)
Species <- rev(species)
AvgPW <- rev(AvgPW)

Petals <- data.frame(Species, AvgPW)
Petals</pre>
```

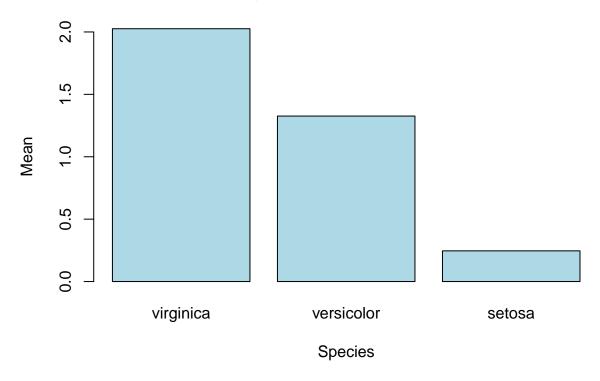
```
## Species AvgPW
## 1 virginica 2.026
## 2 versicolor 1.326
## 3 setosa 0.246
```

What do you think of piping? Do you find it intuitive and useful, or are you annoyed that you have another thing to learn?

A: I do find it a lot more intuitive. Trying to find a way to do the same things with base R functionality is much harder and you have to got through a lot more steps. The syntax also makes more sense.

OK, so we have all this nice wrangled data. What is something we can do with it? Make a plot! For the mean Petal.Width by Species data we have a quantitative numeric variable (Petal.Width) and a categorical variable (Species). This means we make a barplot. Explore the barplot help documentation and make the appropriate barplot.

Average Petal Widths by Species



4.11 Section 4.11 discusses *tibbles*, which are opinionated versions of dataframes. The **tidyverse** package prefers tibbles over ordinary dataframes, for reasons listed in section 4.11.

Read this section and explain which of the reasons given is the most compelling to you.

A: I think the versatility of it as specified in 4.11.2 is probably the most compelling reason to me. It can return a tibble, but if you want the vector/column you can still use the \$ to access it. It is important that it returns a tibble when you subset because some functions require you to input a data frame which can only be done this way with tidyverse, but if you use a function requires a vector, you can just as easily access it. This allows for more functions to be used and allows for more ability to work with a data frame.

4.8 and 4.12 Read about the pull function and the placeholder operator in sections 4.8 and 4.12. We will use them as needed.

Write some example code that illustrates the placeholder operator. Your example MUST be different than the one given in the text.

```
#Write your code here.
4 %>% sqrt(x = .)

## [1] 2

c(1, 2, 3, 4, 5) %>% max(.)

## [1] 5
```

```
c(1, 2, 3, 4, 5) %>% min(.)

## [1] 1

c(1, 2, 3, 4, 5) %>% mean(.)
```

4.13 The purr package is described in section 4.13. Within the purr function is the map function, which does similar things to sapply.

sapply applies functions over a list, vector, matrix, or dataframe. For example, we can use it if we want the mean for all the quantitave variables in our newwars dataframe:

```
sapply(newwars, mean, na.rm=T)
```

```
mass hair_color skin_color
##
         name
                   height
                                                                eye_color birth_year
##
                174.60494
                                                                            87.56512
           NA
                             97.31186
                                               NA
                                                           NA
                                                                       NA
##
                   gender
                           homeworld
                                          species
                                                        films
                                                                 vehicles
                                                                           starships
          sex
##
           NA
                       NA
                                   NA
                                               NA
                                                           NA
                                                                       NA
                                                                                   NA
##
         avHW
    135.83390
##
```

map does basically the same thing, but is preferred over sapply because it *always* returns a list. Whereas, what sapply returns depends on what you give it.

```
map(newwars, mean, na.rm=T)
```

```
## $name
## [1] NA
##
## $height
## [1] 174.6049
##
## $mass
## [1] 97.31186
##
## $hair_color
## [1] NA
##
## $skin_color
## [1] NA
##
## $eye_color
## [1] NA
##
## $birth_year
## [1] 87.56512
##
## $sex
## [1] NA
```

[1] 3

```
##
## $gender
   [1] NA
##
## $homeworld
   [1] NA
##
##
## $species
## [1] NA
##
## $films
  [1] NA
##
##
## $vehicles
## [1] NA
##
## $starships
  [1] NA
##
## $avHW
## [1] 135.8339
```

##

135.83390

The map_dbl function always returns a vector of numerical values.

```
map_dbl(newwars, mean, na.rm=T)
##
         name
                   height
                                 mass hair_color skin_color
                                                                eye_color birth_year
##
           NA
                174.60494
                             97.31186
                                               NA
                                                           NA
                                                                        NA
                                                                             87.56512
                                          species
##
          sex
                   gender
                            homeworld
                                                        films
                                                                 vehicles
                                                                            starships
##
           NA
                       NA
                                    NA
                                                NA
                                                            NA
                                                                        NA
                                                                                    NA
##
         avHW
```

Use both sapply and map_dbl to produce the means of all the numerical variables in the iris dataset. Do the results look similar to each other?

```
# Write your code here.
sapply(iris, mean, na.rm=T)
                 Sepal.Width Petal.Length
## Sepal.Length
                                             Petal.Width
                                                               Species
       5.843333
                                   3.758000
##
                     3.057333
                                                1.199333
                                                                    NA
map_dbl(iris, mean, na.rm=T)
##
  Sepal.Length
                  Sepal.Width Petal.Length
                                             Petal.Width
                                                               Species
##
       5.843333
                     3.057333
                                   3.758000
                                                1.199333
                                                                    NA
```

A: The results look identical.

4.14 Often we need to define a new categorical variable based on the values of some other variable. We do this by using use the case_when and between operators.

The between function determines if a value falls within an interval. So we can ask the hard hitting questions like is Luke Skywalker's height between 1.5 and 2 meters?

```
between(newwars$height[newwars$name=="Luke Skywalker"],150,200)
```

```
## [1] TRUE
```

Using between is certainly easier than relying only on the > and < operators. Reproduce the above between code using the > and < operators.

```
newwars$height[newwars$name=="Luke Skywalker"] > 150 & newwars$height[newwars$name=="Luke Skywalker"] <
```

```
## [1] TRUE
```

Now use the between function to determine if Darth Vader's height is between that of Luke Skywalker and Chewbacca.

[1] TRUE

```
#newwars$height[newwars$name == "Darth Vader"] --> 202
#newwars$height[newwars$name == "Luke Skywalker"] --> 172
#newwars$height[newwars$name == "Chewbacca"] --> 228
```

The case_when function is useful for vectorizing conditional statements. It is similar to ifelse but can output any number of values, as opposed to just TRUE or FALSE.

```
case_when(
  between(newwars$height[newwars$name=="Luke Skywalker"],150,200) ~ "Luke Skywalker is between 150 and 17RUE ~ "Luke Skywalker is not between 150 and 200 cm tall")
```

```
## [1] "Luke Skywalker is between 150 and 200 cm tall."
```

Now let's get to the part where we define a new categorical variable based on the values of some other variable. Let's create a categorical height variable for the star wars characters.

```
newwars3 <- newwars %>% mutate(catheight = case_when (
  between(height,0,99) ~ "Short",
  between(height,100,199) ~ "Medium",
  between(height,200,299) ~ "Tall",
  TRUE ~ "F"
))
head(newwars3)
```

```
## # A tibble: 6 x 16
## name height mass hair_color skin_color eye_color birth_year sex gender
## <chr> <int> <dbl> <chr> <chr> <chr> <chr>
```

```
## 1 Luke Sky~
                  172
                          77 blond
                                        fair
                                                    blue
                                                                    19
                                                                         male
                                                                                mascu~
## 2 C-3PO
                  167
                          75 <NA>
                                                                   112
                                        gold
                                                                         none
                                                    yellow
                                                                                mascu~
                                        white, bl~ red
## 3 R2-D2
                   96
                          32 <NA>
                                                                    33
                                                                         none
                                                                                mascu~
## 4 Darth Va~
                  202
                         136 none
                                                                    41.9 male
                                        white
                                                    yellow
                                                                                mascu~
## 5 Leia Org~
                  150
                          49 brown
                                        light
                                                    brown
                                                                    19
                                                                          fema~ femin~
## 6 Owen Lars
                  178
                         120 brown, gr~ light
                                                    blue
                                                                    52
                                                                         male mascu~
## # i 7 more variables: homeworld <chr>, species <fct>, films <list>,
       vehicles <list>, starships <list>, avHW <dbl>, catheight <chr>
```

Now it is your turn. For the exams dataset, create a categorical grade variable for exam1 where 45-50 is an "A", 40-44 is a "B", 35-39 is a "C", and 30-34 is a "D".

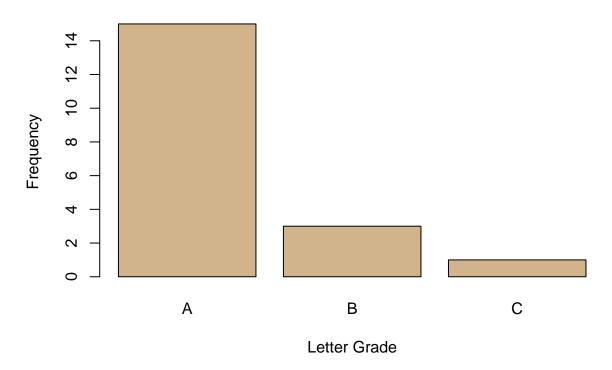
```
# Write your code here.
load('exams.rda')
exams3 <- exams %>% mutate(catgrade = case_when(
  between(exam1,45,50) ~ "A",
  between(exam1,40,44) ~ "B",
  between(exam1,35,39) ~ "C",
  between(exam1,30,34) ~ "D",
  TRUE ~ "F"
)))
exams3
```

```
##
       ID exam1 exam2 improve catgrade
## 1
              48
                     48
        1
                               0
## 2
        2
              47
                     46
                              -1
                                         Α
## 3
        3
              39
                     42
                               3
                                         C
## 4
        4
              46
                     47
                               1
                                         Α
## 5
        5
              45
                     45
                               0
                                         Α
## 6
              50
                               0
                                         Α
        6
                    50
## 7
        7
              50
                    45
                              -5
                                         Α
## 8
        8
              41
                    43
                               2
                                         В
## 9
        9
              50
                     46
                              -4
                                         Α
## 10 10
              47
                    46
                              -1
                                         Α
## 11 11
              41
                    39
                              -2
                                         В
## 12 12
              50
                    50
                               0
                                         Α
## 13 13
              47
                     47
                               0
                                         Α
                              -2
## 14 14
              47
                     45
                                         Α
## 15 15
              47
                    31
                             -16
                                         Α
                                         В
## 16 16
              42
                    31
                             -11
## 17 17
              47
                     49
                               2
                                         Α
## 18 18
              46
                     45
                              -1
                                          Α
## 19 19
                              -7
              46
                     39
                                         Α
```

Bonus: can you figure out how to make a barplot showing the frequencies of each letter grade?

```
ylab = "Frequency",
col = "tan")
```

Grade Frequencies



If you are interested in even more practice, work through the exercises in sections 4.6, 4.10, and 4.15 of the textbook:

rafalab.dfci.harvard.edu/dsbook/tidyverse.html # exercises-10

rafalab.dfci.harvard.edu/dsbook/tidyverse.html # exercises-11

rafalab.dfci.harvard.edu/dsbook/tidyverse.html # exercises-12